

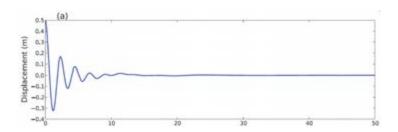
Dr Josh Davidson

June - 2025

### Part 2 - NWT Experiments and Implementation

#### Outline

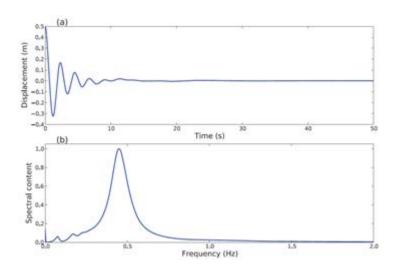
- Free Decay Experiments
- Input Force
- Wave driven motion
- Moorings
- Currents
- Wind turbines
- Machine Learning



<sup>&</sup>lt;sup>2</sup>Davidson, Giorgi and Ringwood, *Identification of wave energy device models from numerical wave tank data - Part 1: Numerical wave tank identification tests*, IEEE Transactions on Sustainable Energy, 2016

## Types of experiments and measurements

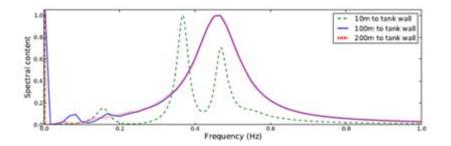
Free decay



<sup>&</sup>lt;sup>2</sup>Davidson, Giorgi and Ringwood, *Identification of wave energy device models from numerical wave tank data - Part 1: Numerical wave tank identification tests*, IEEE Transactions on Sustainable Energy, 2016

## Types of experiments and measurements

Free decay : Reflection analysis



## Hydrodynamics

Types

## Hydrodynamics

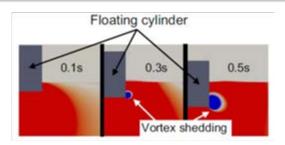
Hydrodynamic Nonlinearities

#### Types

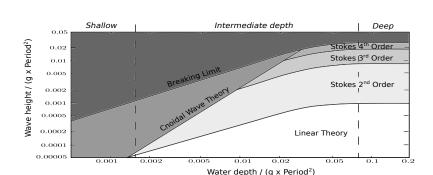
- Viscosity
- Nonlinear ocean waves
- Time-varying wetted body surface

#### Viscosity

- Viscosity gives rise to drag forces, resulting from pressure/form drag and skin friction drag.
- For WECs, pressure drag is the main contributor and skin friction is typically negligible. Pressure drag is caused by flow separation and vortex shedding, whose force on the WEC is nonlinear, increasing quadratically with the relative WEC-water velocity.

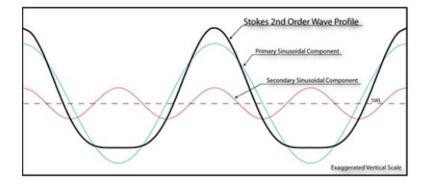


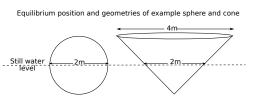
<sup>&</sup>lt;sup>1</sup>Davidson, Giorgi and Ringwood, *Linear parametric hydrodynamic models for ocean wave energy converters identified from numerical wave tank experiments*, Ocean Engineering, 2015

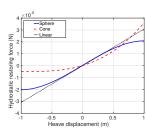


<sup>&</sup>lt;sup>1</sup>Le Mehaute, B. An Introduction to Hydrodynamics and Water Waves; Springer Science & Business Media: Berlin/Heidelberg, Germany, 1976.

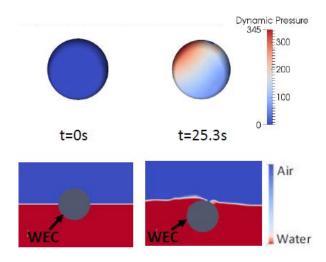
#### Hydrodynamic Nonlinearities - Nonlinear ocean waves



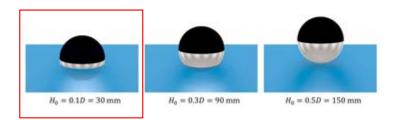


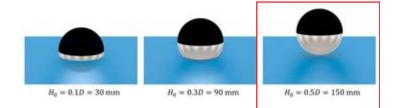


<sup>&</sup>lt;sup>1</sup>Davidson and Costello, *Efficient nonlinear hydrodynamic models for wave energy converter design - A scoping study*, Journal of Marine Science and Engineering (Special Issue "Nonlinear Numerical Modelling of Wave Energy Converters"), 2019



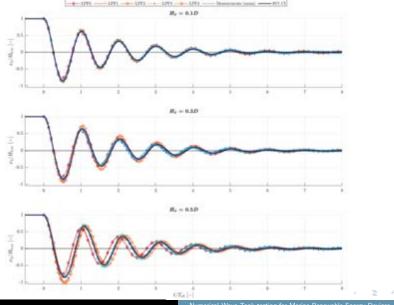
<sup>&</sup>lt;sup>1</sup>Davidson, Windt, Giorgi, Genest and Ringwood, *Evaluation of Energy Maximising Control Systems for WECs using OpenFOAM*, OpenFOAM - Selected papers from the 11th Workshop, 2019





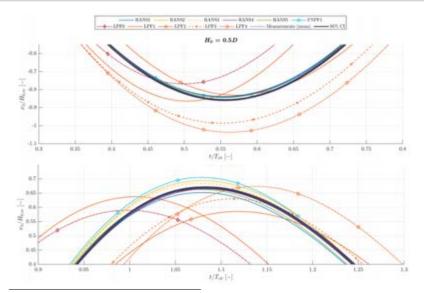
## Free Decay of a Sphere

Benchmark comparison



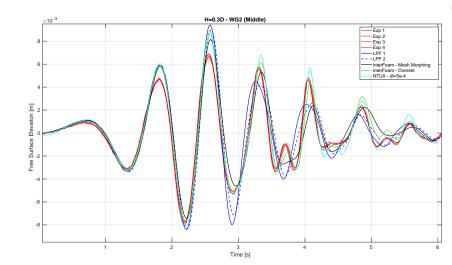
## Free Decay of a Sphere

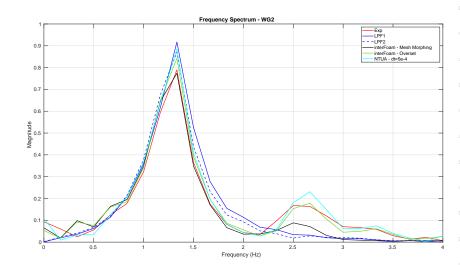
Benchmark comparison



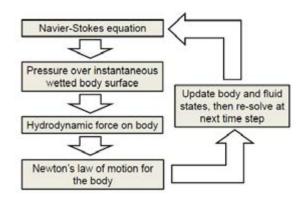
<sup>&</sup>lt;sup>1</sup>Kramer et al, Highly Accurate Experimental Heave Decay Tests with a Floating Sphere: A Public Benchmark Dataset for Model Validation of Fluid-Structure Interaction, Energies, 2021

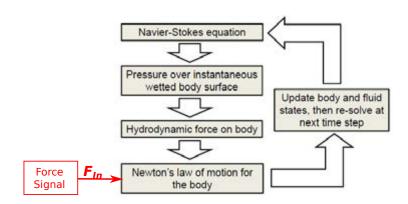
# Free Decay of a Sphere Optimising the NWT

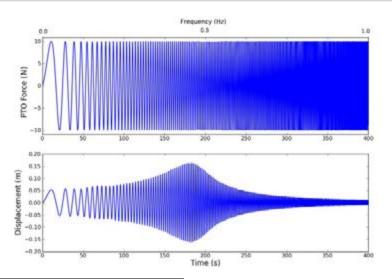




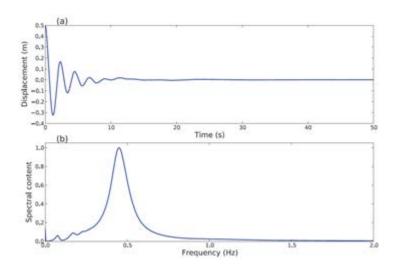
Input Force



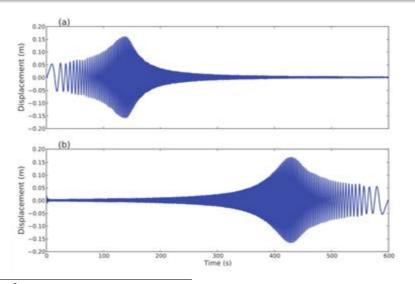


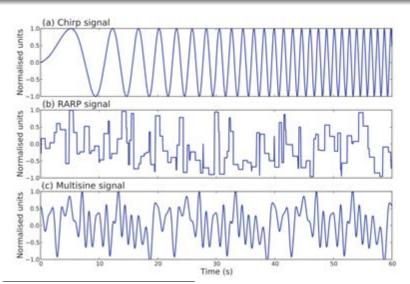


<sup>&</sup>lt;sup>2</sup>Davidson, Giorgi and Ringwood, *Identification of wave energy device models from numerical wave tank data - Part 1: Numerical wave tank identification tests*, IEEE Transactions on Sustainable Energy, 2016

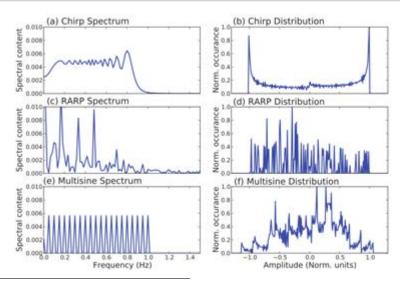


<sup>&</sup>lt;sup>2</sup>Davidson, Giorgi and Ringwood, *Identification of wave energy device models from numerical wave tank data - Part 1: Numerical wave tank identification tests*, IEEE Transactions on Sustainable Energy, 2016 ← □ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ← ◎ → ←

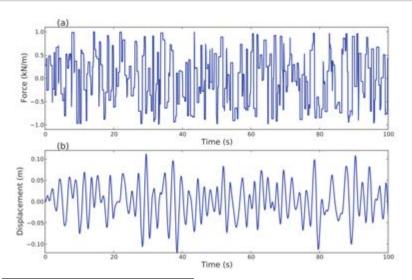


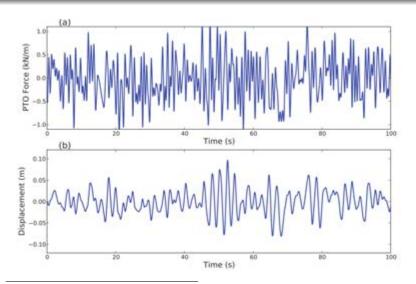


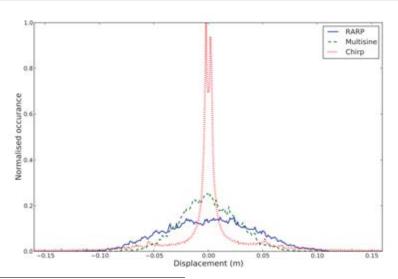
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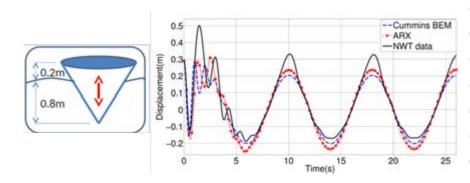






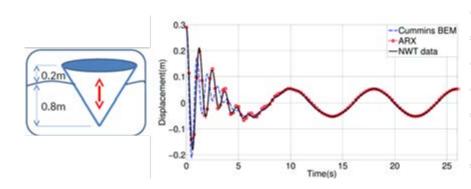
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#### Sinusoidal input PTO force: Amplitude 960N



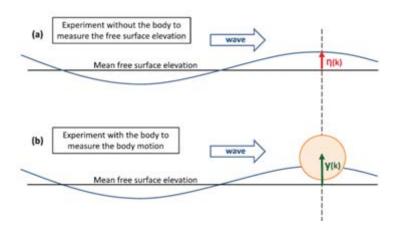
<sup>&</sup>lt;sup>1</sup>Davidson, Giorgi and Ringwood, *Numerical wave tank identification of nonlinear discrete time hydrodynamic models*, 1st RENEW Conference, 2014

#### Sinusoidal input PTO force: Amplitude 240N



<sup>&</sup>lt;sup>1</sup>Davidson, Giorgi and Ringwood, *Numerical wave tank identification of nonlinear discrete time hydrodynamic models*, 1st RENEW Conference, 2014

#### Input Waves



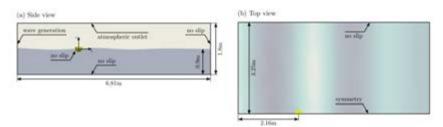
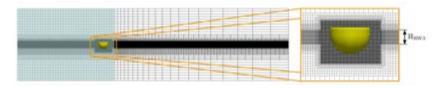
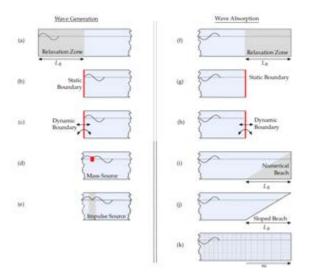


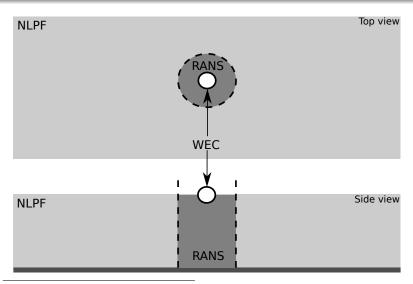
Figure 3. Schematic of the numerical wave tank: Side view (a) and top view (b).



<sup>&</sup>lt;sup>1</sup>Windt, Faedo, Pena-Snachez, Davidson, Ferri and Ringwood, Validation of a CFD-Based Numerical Wave Tank Model of the 1/20th Scale Wavestar Wave Energy Converter, Fluids, 2020

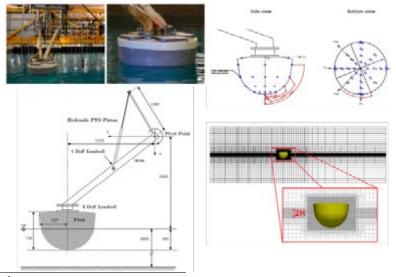


<sup>&</sup>lt;sup>1</sup>Windt, Davidson, Schmitt and Ringwood, *On the Assessment of Numerical Wave Makers in CFD Simulations*, Journal of Marine Science and Engineering, 2019

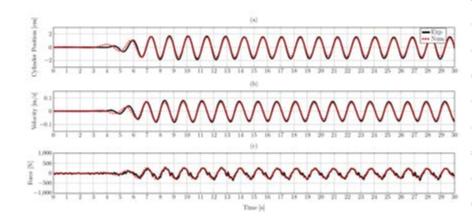


<sup>&</sup>lt;sup>2</sup>Davidson and Costello, *Efficient nonlinear hydrodynamic models for wave energy converter design - A scoping study*, Journal of Marine Science and Engineering (Special Issue "Nonlinear Numerical Modelling of Wave Energy Converters"), 2019

## Input Waves Wavestar Validation



<sup>&</sup>lt;sup>1</sup>Windt, Davidson, Ransley, Greaves, Jakobsen, Kramer and Ringwood, *Validation of a CFD-based numerical wave tank model for the power production assessment of the wavestar ocean wave energy converter*, Renewable Energy, 2020



<sup>1</sup>Windt, Davidson, Ransley, Greaves, Jakobsen, Kramer and Ringwood, *Validation of a CFD-based numerical wave tank model for the power production assessment of the wavestar ocean wave energy converter*, Renewable Energy, 2020

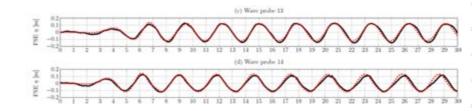
## NWT verification and validation

#### Question

What are some of the challenges/limitations in validating against physical wave tank data?

### NWT verification and validation

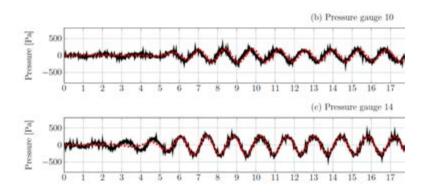
Validation - Reflections



<sup>&</sup>lt;sup>1</sup>Windt, Davidson, Ransley, Greaves, Jakobsen, Kramer and Ringwood, *Validation of a CFD-based numerical wave tank model for the power production assessment of the wavestar ocean wave energy converter*, Renewable Energy, 2020

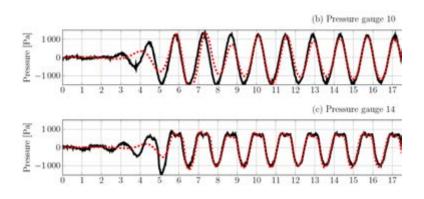
### NWT verification and validation

Validation - Signal to Noise Ratio

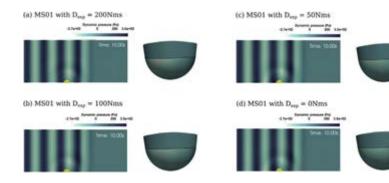


<sup>&</sup>lt;sup>1</sup>Windt, Davidson, Ransley, Greaves, Jakobsen, Kramer and Ringwood, *Validation of a CFD-based numerical wave tank model for the power production assessment of the wavestar ocean wave energy converter*, Renewable Energy, 2020

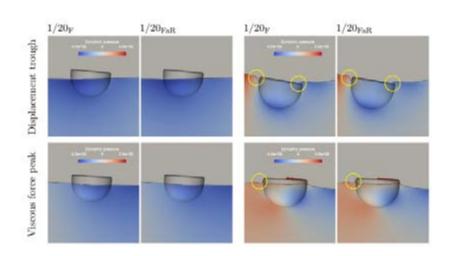
Validation - Signal to Noise Ratio



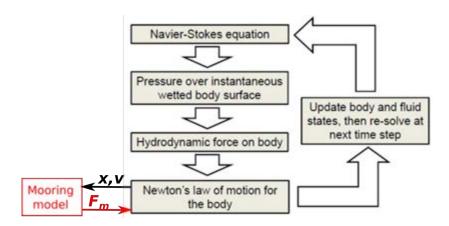
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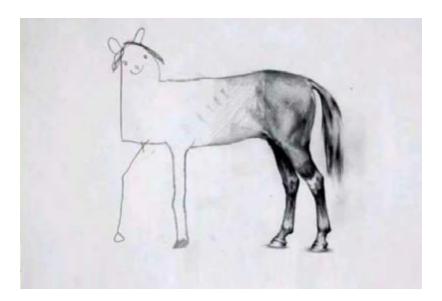


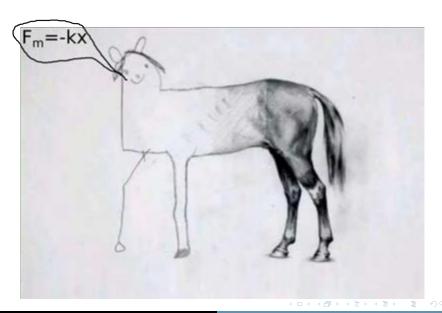
<sup>&</sup>lt;sup>1</sup>Windt, Davidson, Ransley, Greaves, Jakobsen, Kramer and Ringwood, *Validation of a CFD-based numerical wave tank model for the power production assessment of the wavestar ocean wave energy converter*, Renewable Energy, 2020

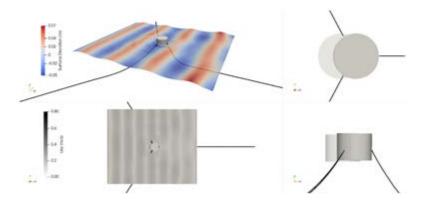


Moorings

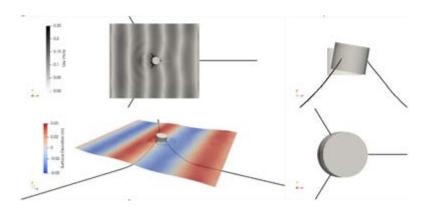






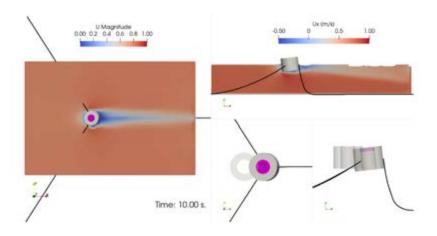


<sup>&</sup>lt;sup>1</sup>Barajas, Lara, Davidson and Romano, *Porous medium-based PTO damping and overset mesh motion: A combined approach for effective OpenFOAM simulations of floating OWCs*, Applied Ocean Research, 2024

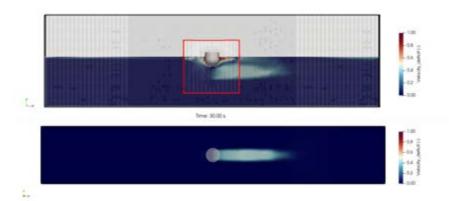


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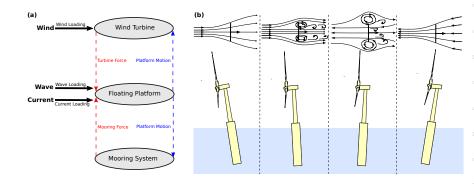
### Currents

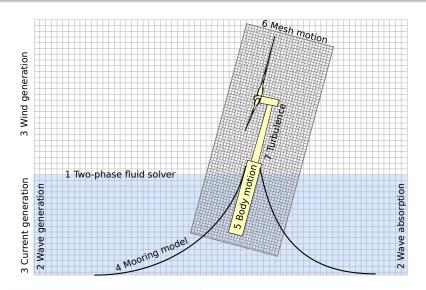


<sup>&</sup>lt;sup>1</sup>Barajas, Lara, Davidson and Romano, *Porous medium-based PTO damping and overset mesh motion: A combined approach for effective OpenFOAM simulations of floating OWCs*, Applied Ocean Research, 2024



# Wind Floating Wind Turbine

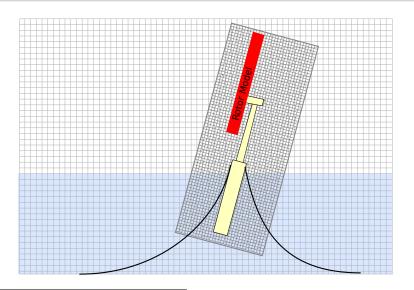




<sup>&</sup>lt;sup>1</sup>Davidson, Barajas and Lara, *Turbines and Thrusters: A Versatile OpenFOAM Framework for Modeling Aerial Rotors on Floating Bodies*, In preparation, 2025

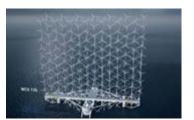
### Floating Wind Turbine

Rotor Modelling???



### Floating Wind Turbine

Rotor Applications

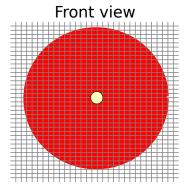


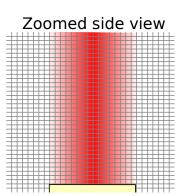






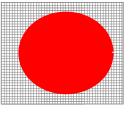


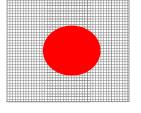




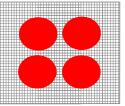
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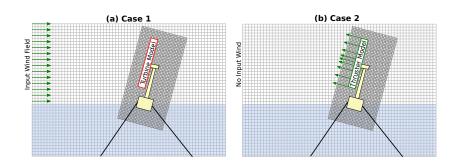
#### Easily adjust rotor characteristics

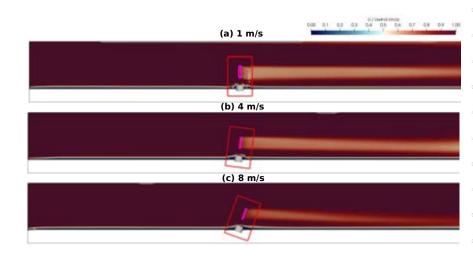




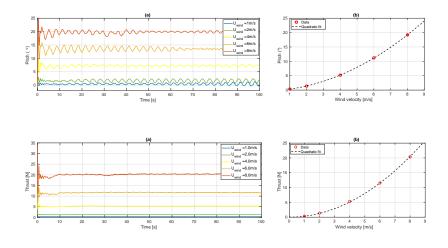
#### **Multiple Rotors**

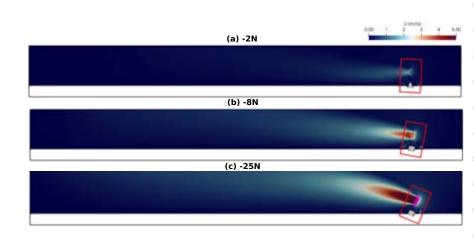






<sup>&</sup>lt;sup>1</sup>Davidson, Barajas and Lara, *Turbines and Thrusters: A Versatile OpenFOAM Framework for Modeling Aerial Rotors on Floating Bodies*, In preparation, 2025

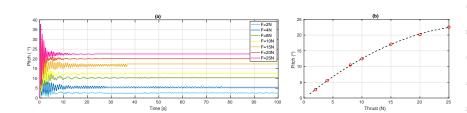




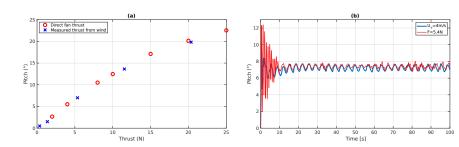
<sup>&</sup>lt;sup>1</sup>Davidson, Barajas and Lara, *Turbines and Thrusters: A Versatile OpenFOAM Framework for Modeling Aerial Rotors on Floating Bodies*, In preparation, 2025 → □ → → □ → → □ → → □ → → □ → → □ → → □ → → □ → → □ → → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □

### Floating Wind Turbine

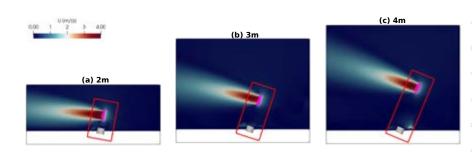
Illustrative Example - Case 2



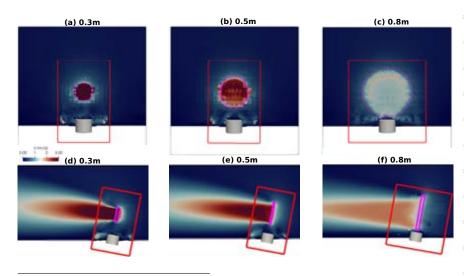
# Floating Wind Turbine Illustrative Example - Comparison



<sup>&</sup>lt;sup>1</sup>Davidson, Barajas and Lara, *Turbines and Thrusters: A Versatile OpenFOAM Framework for Modeling Aerial Rotors on Floating Bodies*, In preparation, 2025 → □ → → ⊕ → → ★ → → ★ ★ → ★ ★ → ★ ★ → ★



Illustrative Example - Rotor Radius



<sup>&</sup>lt;sup>1</sup>Davidson, Barajas and Lara, *Turbines and Thrusters: A Versatile OpenFOAM Framework for Modeling Aerial Rotors on Floating Bodies*, In preparation, 2025 → □ → → □ → → □ → → □ → → □ → → □ → → □ → → □ → → □ → → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □ → □

# NWT Experiments Extreme/Survival Conditions

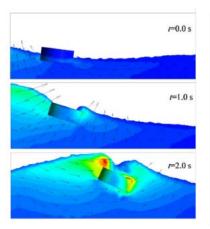
# NWT Experiments Extreme/Survival Conditions

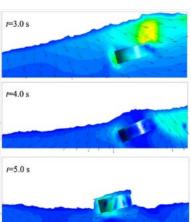
#### Question

Why is a NWT a good tool for Extreme/Survival Condition experiments?

### NWT Experiments

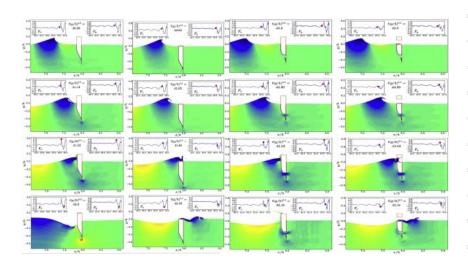
Extreme Conditions - Survival



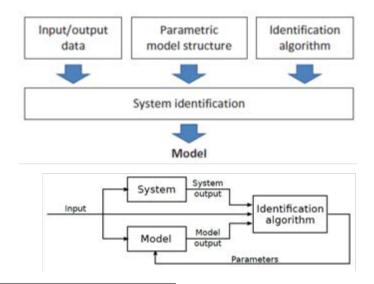


<sup>&</sup>lt;sup>2</sup>Chen et al, *Numerical modelling of a point-absorbing wave energy converter in irregular and extreme waves*, Applied Ocean Research, 2017

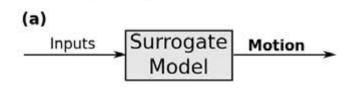
# NWT Experiments Extreme Conditions/Survival

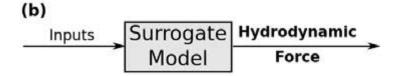


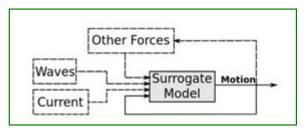
Machine Learning

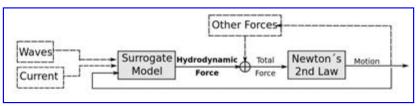


<sup>&</sup>lt;sup>1</sup>Ringwood, Davidson and Giorgi, *Identifying models using recorded data*, Numerical Modelling of Wave Energy Converters: State-of-the-art for single devices and arrays, Academic Press, 2016

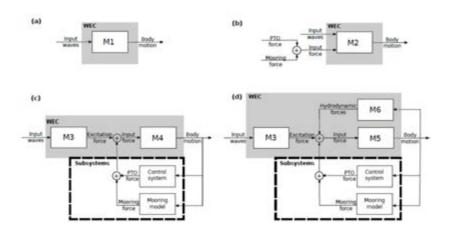




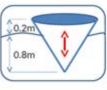








<sup>&</sup>lt;sup>2</sup>Davidson and Costello, Efficient nonlinear hydrodynamic models for wave energy converter design - A scoping study, Journal of Marine Science and Engineering (Special Issue "Nonlinear Numerical Modelling of Wave Energy Converters"), 2019

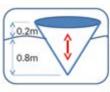


#### Nonlinear heave restoring force

$$(m + \mu_{\infty})\dot{x}_3(t) + \int_0^t K_r(t - \tau)\dot{x}_3(\tau)d\tau + f_s(x_3, t) = f_e(t)$$

$$(m + \mu_{\infty})\ddot{x}_3(t) + \int_0^t K_r(t - \tau)\dot{x}_3(\tau)d\tau + \sum_{i=1}^n a_n x_3^n(t) = f_e(t)$$

<sup>&</sup>lt;sup>1</sup>Davidson, Giorgi and Ringwood, *Numerical wave tank identification of nonlinear discrete time hydrodynamic models*, 1st RENEW Conference, 2014

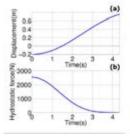


#### Nonlinear heave restoring force

$$(m + \mu_{\infty})\ddot{x}_3(t) + \int_0^t K_r(t - \tau)\dot{x}_3(\tau)d\tau + f_s(x_3, t) = f_e(t)$$

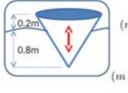


$$(m + \mu_{\infty})\ddot{x}_3(t) + \int_0^t K_r(t - \tau)\dot{x}_3(\tau)d\tau + \sum_{i=1}^n a_n x_3^n(t) = f_e(t)$$



<sup>&</sup>lt;sup>1</sup>Davidson, Giorgi and Ringwood, *Numerical wave tank identification of nonlinear discrete time hydrodynamic models*, 1st RENEW Conference, 2014

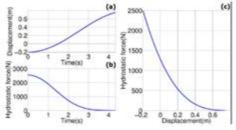
### Nonlinear heave restoring force



$$(m + \mu_{\infty})\ddot{x}_3(t) + \int_0^t K_r(t - \tau)\dot{x}_3(\tau)d\tau + f_s(x_3, t) = f_e(t)$$

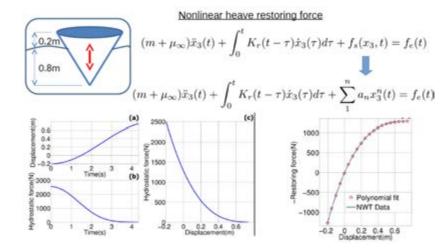


$$(m + \mu_{\infty})\ddot{x}_3(t) + \int_0^t K_r(t - \tau)\dot{x}_3(\tau)d\tau + \sum_{i=1}^n a_n x_3^n(t) = f_e(t)$$



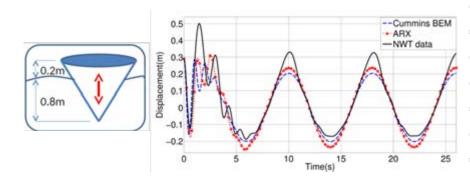
<sup>&</sup>lt;sup>1</sup>Davidson, Giorgi and Ringwood, *Numerical wave tank identification of nonlinear discrete time hydrodynamic models*, 1st RENEW Conference, 2014

## System Identification - Example: Nonlinear Restoring force



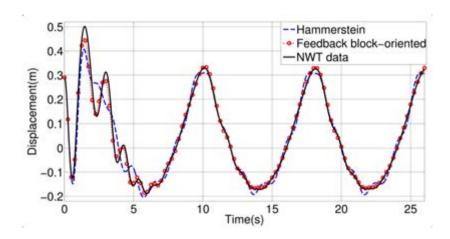
<sup>&</sup>lt;sup>1</sup>Davidson, Giorgi and Ringwood, Numerical wave tank identifcation of nonlinear discrete time hydrodynamic models, 1st RENEW Conference, 2014

#### Sinusoidal input PTO force: Amplitude 960N



<sup>&</sup>lt;sup>1</sup>Davidson, Giorgi and Ringwood, *Numerical wave tank identification of nonlinear discrete time hydrodynamic models*, 1st RENEW Conference, 2014

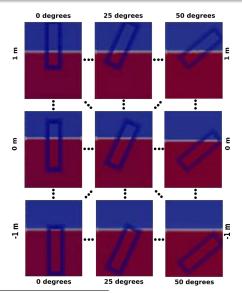
#### System Identification - Example: Nonlinear Restoring force

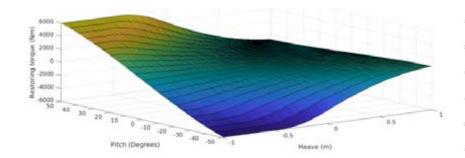


<sup>&</sup>lt;sup>1</sup>Davidson, Giorgi and Ringwood, Numerical wave tank identifcation of nonlinear discrete time hydrodynamic models, 1st RENEW Conference, 2014

# Machine Learning

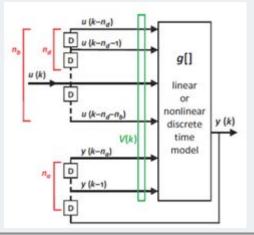
System Identification - Example: Nonlinear Restoring force - 2 DoF



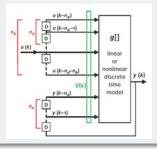


<sup>&</sup>lt;sup>1</sup>Davidson, Karimov, Szelechmann, Windt and Ringwood, *Dynamic mesh motion in OpenFOAM for WEC simulation*, 14th OpenFOAM Workshop, 2019

### Nonlinear Autoregressive with eXogenous terms (NARX)

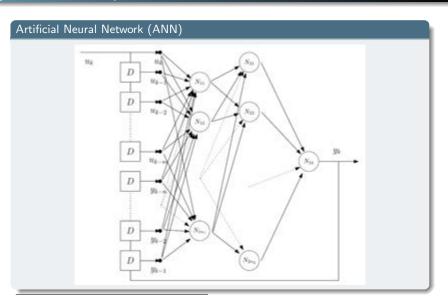


#### Nonlinear Autoregressive with eXogenous terms (NARX)



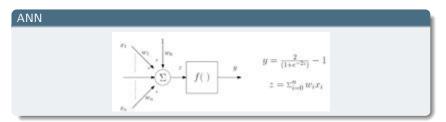
#### ARX

$$y(k) = \sum_{i=1}^{n_b} a_i y(k-i) + \sum_{i=0}^{n_b} b_i u(k-n_d-i).$$



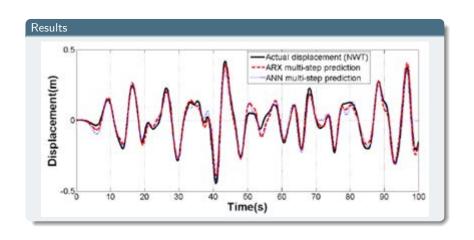
¹Ringwood, Davidson and Giorgi, *Optimising numerical wave tank tests for the parametric identification of wave energy device models*, OMAE, 2015

# Artificial Neural Network (ANN)



<sup>&</sup>lt;sup>1</sup>Ringwood, Davidson and Giorgi, *Optimising numerical wave tank tests for the parametric identification of wave energy device models*, OMAE, 2015

System Identification - Example: Black-box models

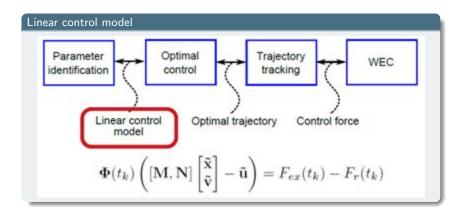


<sup>&</sup>lt;sup>1</sup>Ringwood, Davidson and Giorgi, *Optimising numerical wave tank tests for the parametric identification of wave energy device models*, OMAE, 2015

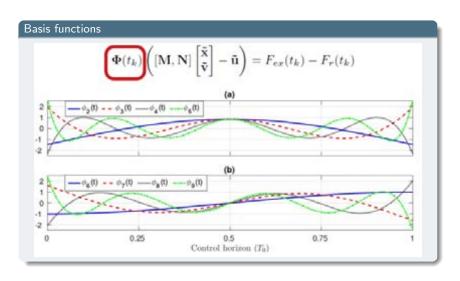
model

# Adaptive control Parameter identification Optimal control Trajectory tracking WEC Linear control Optimal trajectory Control force

<sup>&</sup>lt;sup>1</sup>Davidson, Genest and Ringwood, *Adaptive control of a wave energy converter simulated in a numerical wave tank*, EWTEC, 2017



<sup>&</sup>lt;sup>1</sup>Davidson, Genest and Ringwood, *Adaptive control of a wave energy converter simulated in a numerical wave tank*, EWTEC, 2017

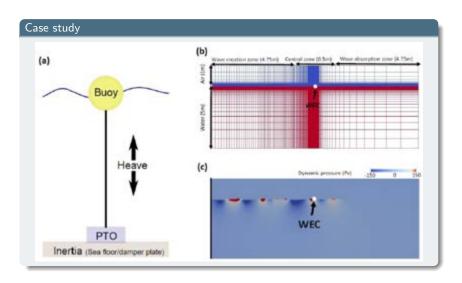


<sup>&</sup>lt;sup>1</sup>Genest, Davidson and Ringwood, *Adaptive control of a wave energy converter*, IEEE Transactions on Sustainable Energy, 2018

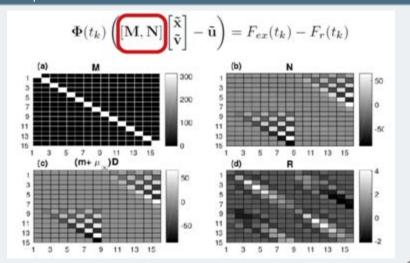
# Optimisation Optimal Parameter Trajectory WEC identification control tracking Linear control Optimal trajectory Control force model $\Phi(t_k)\left([\mathbf{M}, \mathbf{N}]\begin{bmatrix} \tilde{\mathbf{X}} \\ \tilde{\mathbf{v}} \end{bmatrix} - \tilde{\mathbf{u}}\right) = F_{ex}(t_k) - F_r(t_k)$ The optimal controller maximises the absorbed energy, J, over the control horizon, I: $J = -\int_{t} v(t)u(t)dt$

# Optimisation Optimal Trajectory Parameter WEC identification control tracking Linear control Optimal trajectory Control force model $\Phi(t_k)\left([\mathbf{M}, \mathbf{N}]\begin{bmatrix} \tilde{\mathbf{x}} \\ \tilde{\mathbf{v}} \end{bmatrix} - \tilde{\mathbf{u}}\right) = F_{ex}(t_k) - F_r(t_k)$ The optimal controller maximises the absorbed energy, J, over the control horizon, I: $J = -\int_{I} v(t)u(t)dt$ $J \propto -\tilde{\mathbf{v}}^T \tilde{\mathbf{n}}$

 $<sup>^1</sup>$ Davidson, Genest and Ringwood, Adaptive control of a wave energy converter simulated in a numerical wave tank, EWTEC, 2017



#### Model parameters



<sup>&</sup>lt;sup>1</sup>Genest, Davidson and Ringwood, *Adaptive control of a wave energy converter*, IEEE Transactions on Sustainable Energy, 2018

## Parameter adaptation

$$\Phi(t_k) \left( [\mathbf{M}, \mathbf{N}] \begin{bmatrix} \tilde{\mathbf{X}} \\ \tilde{\mathbf{V}} \end{bmatrix} - \tilde{\mathbf{u}} \right) = F_{ex}(t_k) - F_r(t_k)$$

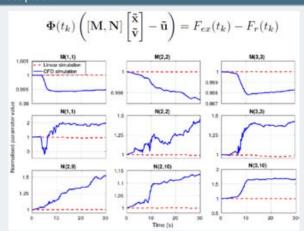
Transactions on Sustainable Energy, 2018

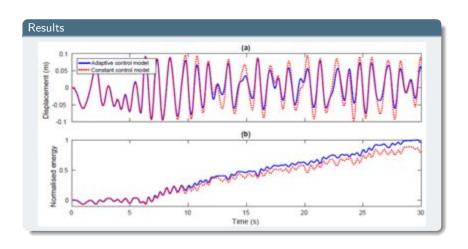
<sup>&</sup>lt;sup>1</sup>Genest, Davidson and Ringwood, Adaptive control of a wave energy converter, IEEE

#### Question

Why does the magnitude of the parameters in the M matrix decrease due to the online identification?

#### Parameter adaptation





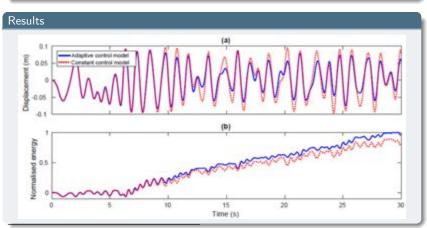
<sup>&</sup>lt;sup>1</sup>Genest, Davidson and Ringwood, *Adaptive control of a wave energy converter*, IEEE Transactions on Sustainable Energy, 2018

#### **NWT** Experiments

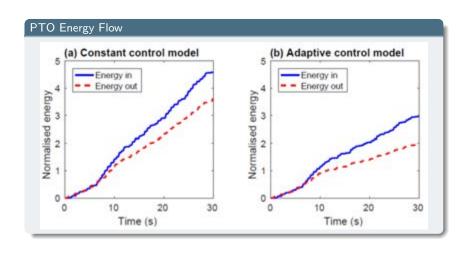
System Identification - Example: Online Identification

#### Question

Why does the trajectory in the adaptive control simulation have a smaller amplitude than in the constant control model simulation?



<sup>&</sup>lt;sup>1</sup>Genest, Davidson and Ringwood, *Adaptive control of a wave energy converter*, IEEE Transactions on Sustainable Energy, 2018



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#### Conclusions

- Extensive design iteration and optimisation at low TRL levels is vital for the successful development of a MRE device
- NWTs are a valuable tool in the successful development of a MRE device
- A range of methods are available with a trade-off between accuracy and computational expense
- Modern day computing power allows the use of RANS CFD for an increasing variety of applications
- Different methods have strengths/advantages and the best choice may be case dependent, or could involve a combination of methods
- Growing Opensource communities are reducing barriers to NWT development
- When analysing a MRE in a NWT it is important to consider the entire system, with the complete energy flow from input resource to output power.
  - A chain is only as strong as its weakest link
  - Using low fidelity models for subsystems may negate the gains in accuracy acheived by computationally expensive models in other parts of the system
- NWTs offer significant advantages in the range of experiments and measurements available